

# Microstructure Characterization and Modeling for Improved Electrode Design

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National Renewable Energy Laboratory  
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Daniel Abraham, Andy Jansen, **Argonne National Laboratory**  
Aashutosh Mistry, Ankit Verma, Partha Mukherjee, **Purdue University**

# Overview

*This project was awarded in response to VTO Fiscal Year (FY) 15 Lab Call.*

## Timeline

- Project start date: Oct. 2015
- Project end date: Sept. 2019
- Percent complete: 85%

## Budget

- Total project funding: \$ 3.35M
  - DOE share: 100%
- Funding received in FY 2016: \$1.05M
- Funding received in FY 2017: \$1.05M
- Funding received in FY 2018: \$600k
- Funding received in FY 2019: \$650k

## Barriers

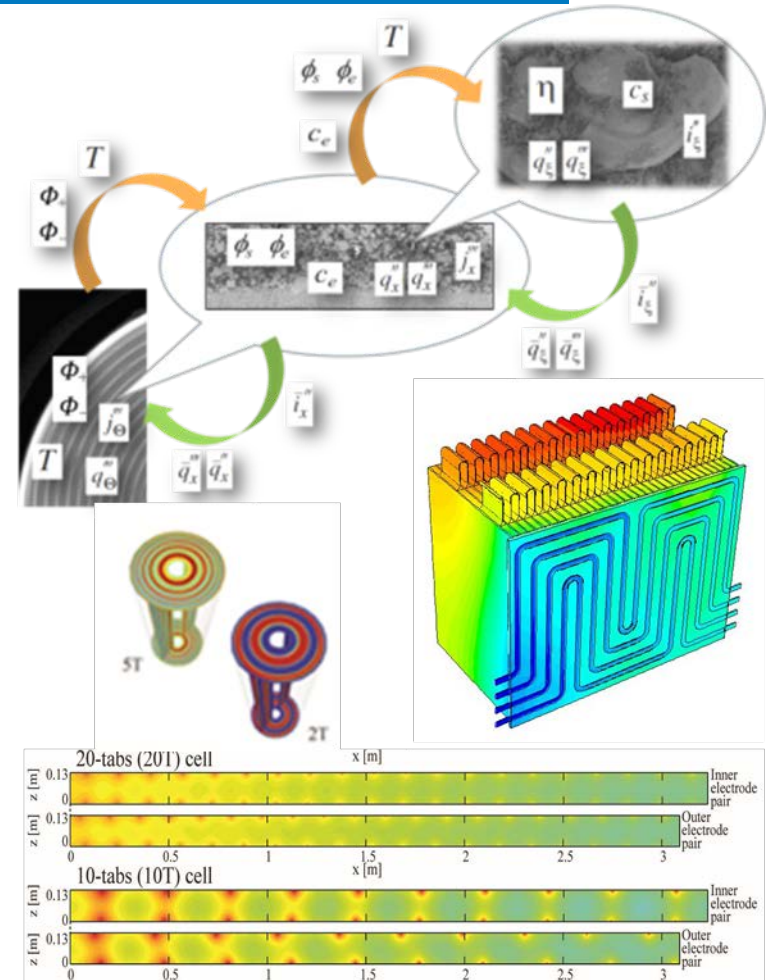
- Gaps between modeling tools and cell design process in the industry
- Lack of simulation models capturing the effect of electrode recipe, including inert components, on performance
- Low-cost, thick electrodes limited by tortuosity

## Partners

- Lead: National Renewable Energy Lab (NREL)
  - Microstructure characterization and 3D simulation.
- Argonne National Laboratory (ANL)
  - Graphite/Nickel-Manganese-Cobalt 532 (NMC532) electrode library and electrochemical characterization
- Purdue University
  - Stochastic reconstruction of electrodes and carbon-binder numerical generation
  - Meso-scale modeling of electrode recipes
- University College of London (UCL)
  - X-ray computed tomography imaging
- Brigham Young University (BYU)
  - Tortuosity measurement

# Relevance

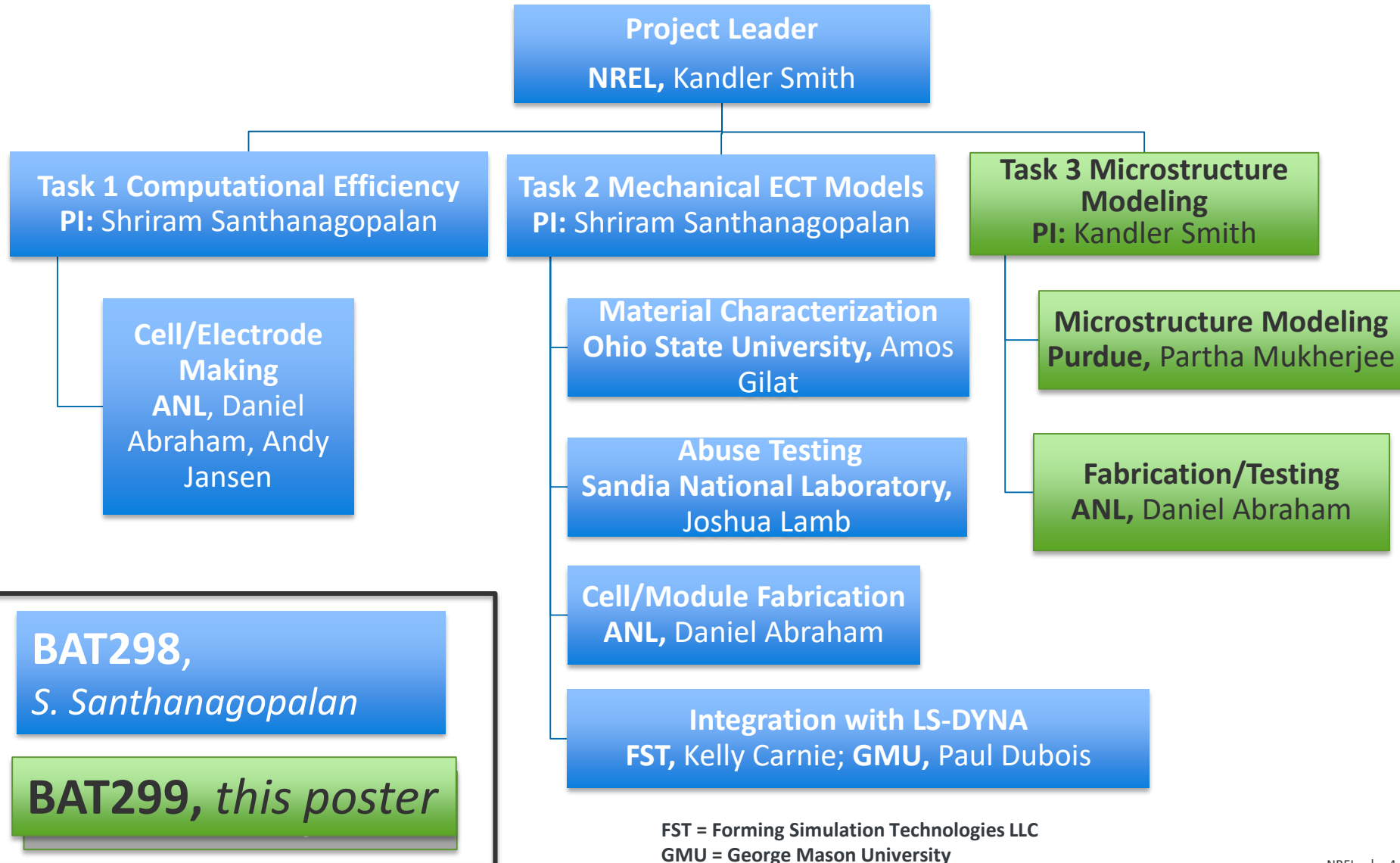
- VTO launched the Computer-Aided Engineering of Batteries (CAEBAT) project to develop validated modeling tools to accelerate development of batteries, in support of vehicle electrification R&D to reduce dependence on imported oil.
- Over 40 different end users from the community have adopted the Multi-Scale Multi-Domain (MSMD) modeling approach developed under CAEBAT.
- Feedback from the first few sets of end users has helped us identify priorities that will enable wider use of model-based design:
  - Standardize identification of the model parameters
  - Increase computational efficiency
  - Extend the models to include mechanical failure of cells and packaging components
  - **Close gaps between materials R&D and CAEBAT modeling tools**
- We are now licensing beta versions of NREL models to the industry and academic partners to identify technical gaps in simulation capabilities.



*MSMD models previously developed in CAEBAT have been widely adapted in the community and have helped us identify gaps.*

# Project Structure

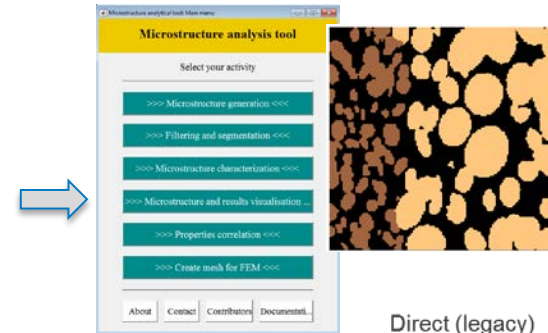
**Project Title:** Computer-Aided Battery Engineering Consortium



# Relevance – March 2018 to March 2019 Objectives

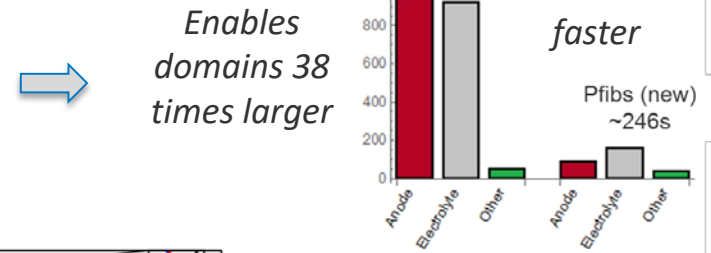
## 1) *Microstructure analysis:*

- Build an open-source toolbox to speed up & standardize the macro- and micro-battery modeling workflow
- Develop microstructure generation algorithm dedicated to investigate particle heterogeneities impact on degradation mechanism and alternative electrode design



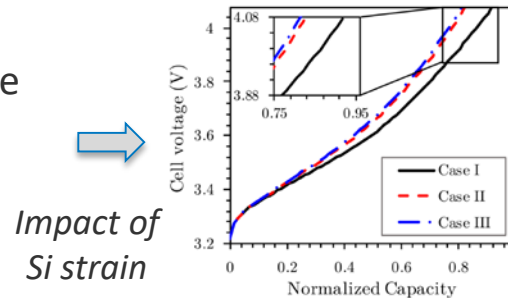
## 2) *3D microstructure modeling*

- Improve numerical stability and speed up numerical calculation to enable calculations on representative volume



## 3) *Electrochemical macro-homogenous model extension to new physics*

- Implement large deformation for silicon anode
- Consider multi-phase, multi-reaction and polycrystalline systems



Impact of  
Si strain

NMC532  
Polycrystalline  
architecture



Impact: By making disruptive computer-aided engineering (CAE) design tools for use by the battery community, this effort supports the following goals identified by the VTO:

1. Reduce the number and duration of battery test cycles in the industry to enable a path to \$80/kWh electric vehicle (EV) battery cost
2. Provide physical insights to optimize thick electrode designs for low-cost, high energy density cells with reliable, high rate performance, considering different chemistry and complex reaction

# Milestones

	Milestone Name/Description	Deadline	Milestone Type	Status
Computational Efficiency	M 1.2 MSMD identification and simulation of graphite/NMC532 system	1/31/2017	Quarterly Progress Measure (Qrt. Prog. Meas.)	Done
	M 1.4 Submit journal article on analysis of NMC532 solid state diffusivity concentration dependence from Galvanostatic Intermittent Titration Technique (GITT) experiments	11/30/2017	Qrt. Prog. Meas.	Done
	M 1.5 Report summarizing ability of macro-homogeneous model to predict performance of ANL Cell Analysis, Modeling, and Prototyping (CAMP) electrodes of varying thickness and porosity	3/31/2018	Qrt. Prog. Meas.	Done
Mechanical Abuse	M 2.2 Detailed documentation describing the mechanical tests procedure for development and validation of constitutive models for individual battery components	7/31/2017	Annual SMART	Done
	M 2.3 Interim update on mechanical models demonstrating damage propagation	6/30/2018	Qrt. Prog. Meas.	Done
	M 2.4 Report summarizing model validation for mechanical-electrochemical-thermal (MECT) simulations	9/30/2018	Qrt. Prog. Meas.	Done
	M 2.5 Document implementation of mechanical abuse simultaneous coupling in the form of case studies (.k files) that can be distributed	3/31/2019	Qrt. Prog. Meas.	Done
	M 2.6 Present final report on the MECT models at the Vehicle Technologies Office Annual Merit Review	6/30/2019	Annual SMART	On track
Microstructure	M 3.2 Present microstructure project update at AMR	4/30/2017	Qrt. Prog. Meas.	Done
	M 3.3 Comparison of microstructural model simulations from both stochastic reconstructed (simulated) and tomographic (measured) geometries	9/30/2017	Qrt. Prog. Meas. (Go/No-Go)	Done
	M 3.4 Report on 3D microstructure electrochemical model algorithm enhancements for improved computational speed, accuracy, and scalability	12/31/2018	Qrt. Prog. Meas.	Done
	M 3.5 Demonstrate electrochemical models enhanced with mechanical and/or multi-reaction mechanisms with application to VTO materials research	9/30/2019	Qrt. Prog. Meas.	On track



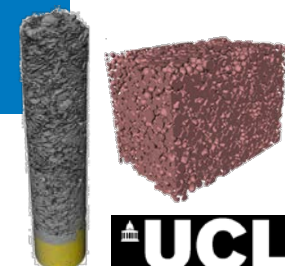
# Approach

**PURDUE**  
UNIVERSITY

Carbon-Binder  
Domain (CBD)  
numerical  
generation &  
meso-scale  
physics



Validation of virtual 3D  
geometry

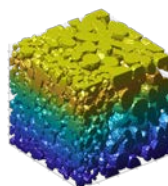


Tomographic  
measurement

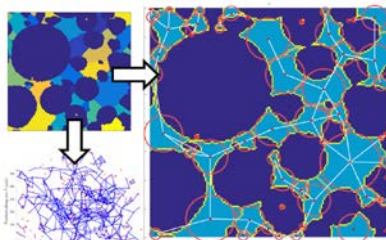


## Microstructure analysis

**Geometry**  
(generated &  
tomography-based)



**Microstructure  
characterization**



$\varepsilon, \tau, D_{50}, S_p, \dots$

**Physics**  
(electro-  
chemical  
model)

$$\begin{aligned} \text{Electrolyte: } \frac{\partial c_e}{\partial t} &= -\nabla \cdot N_e & N_e &= -D_e \nabla c_e + \frac{F}{RT} c_e \nabla \phi \\ 0 &= -\nabla \cdot j_e & j_e &= -\sigma_e \nabla \phi + \kappa_D \nabla \ln(c_e) \\ \sigma_D &= (1 - \epsilon^*) (1 + A_e) \frac{2\kappa_D RT}{F} \end{aligned}$$

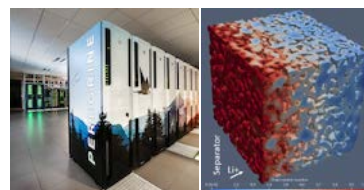
$$\begin{aligned} \text{Anode: } N_a &= -D_a \nabla c_a & j_a &= -\sigma_a \nabla \phi \\ \frac{\partial c_a}{\partial t} &= -\nabla \cdot N_a & 0 &= -\nabla \cdot j_a \end{aligned}$$

$$\begin{aligned} \text{Cathode: } N_c &= -D_c \nabla c_c & j_c &= -\sigma_c \nabla \phi \\ \frac{\partial c_c}{\partial t} &= -\nabla \cdot N_c & 0 &= -\nabla \cdot j_c \end{aligned}$$

Butler-Volmer Interface Condition:

$$j_{a0} = j_{c0} = j_{00} \exp\left(\frac{\alpha_a F}{RT} (\phi - \phi_{eq})\right) \exp\left(-\frac{\alpha_c F}{RT} (\phi - \phi_{eq})\right)$$

**High  
performance  
computing  
(HPC)**



Argonne  
NATIONAL LABORATORY

Electrode fabrication,  
& electrochemical  
response

**UC San Diego**

Ni-rich NMC cathodes

Suggest  
new  
design



Homogenization  
experimental  
verification

Homogenization

Electrochemical simulation

Linkage to CAEBAT macroscopic simulation  
toolsets. **Implement multi-physics, multi-  
reaction mechanisms**

Linkage to extreme fast charge  
program BAT339

# Technical Accomplishments and Progress

## Material Microstructure Analysis

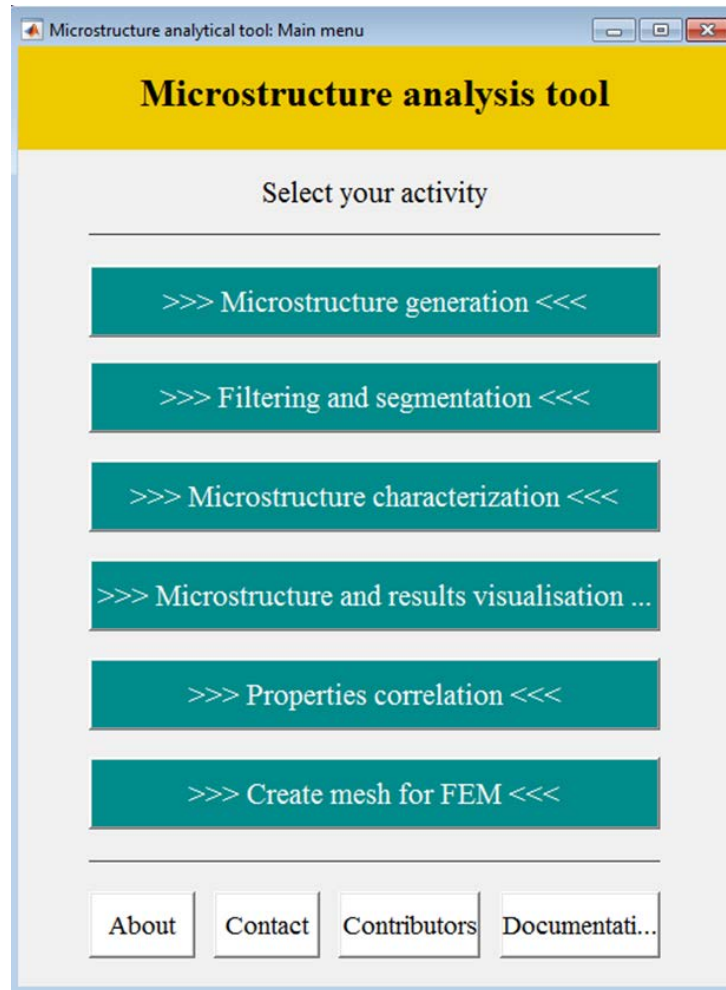
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# Microstructure Analysis Tool

- Microstructure analysis supports macro-homogenous (provides microstructure parameters) and micro-scale (provide geometry) electrochemical battery models.
- Automated workflow based upon a graphic user-interface (GUI) can **reduce working time, errors, and promote standard analysis beneficial for reproducibility and comparability.**
- NREL is developing a MATLAB user-friendly GUI microstructure analysis open-source toolbox, which covers most of the microstructure-related tasks:
  - 3D microstructure generation
  - 3D microstructure filtering and segmentation
  - 3D microstructure characterization and properties correlation
  - 3D microstructure meshing (Iso2mesh third-party open-source code)

*Tool not restricted to battery microstructure.  
Applicable to any other porous materials  
(e.g., fuel cell electrodes)*



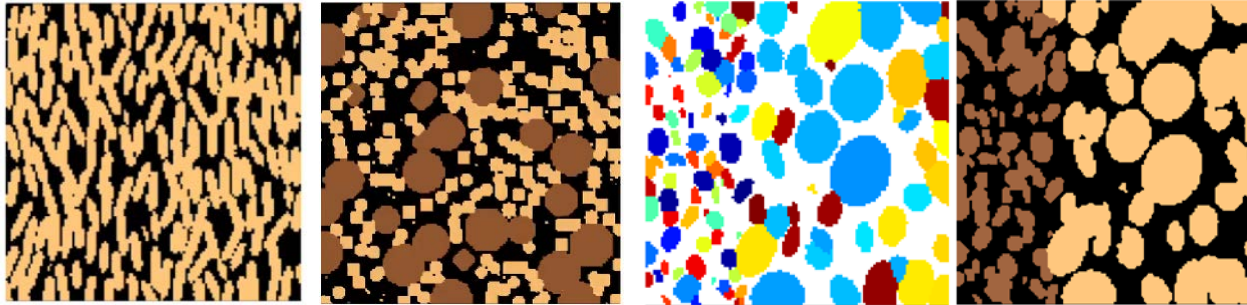
Algorithms  
95% done

GUI  
70% done

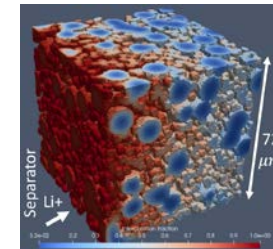
*On track to be published open-source this year at*  
<https://www.nrel.gov/transportation/data-tools.html>

# Examples and Applications: 3D Volumes

- Investigate “what if” electrodes (microstructure generation)

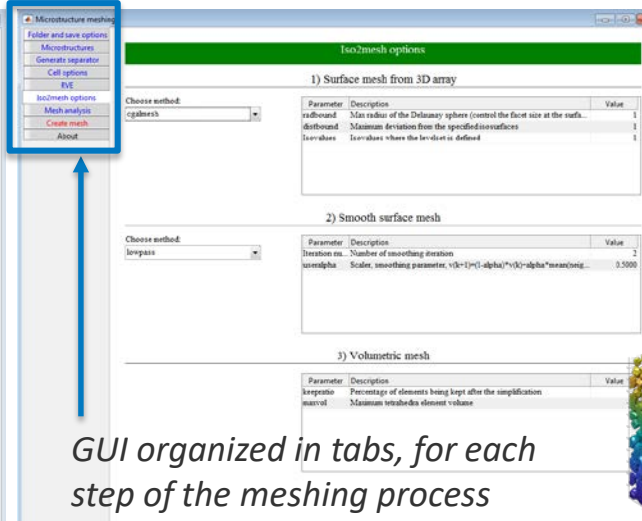
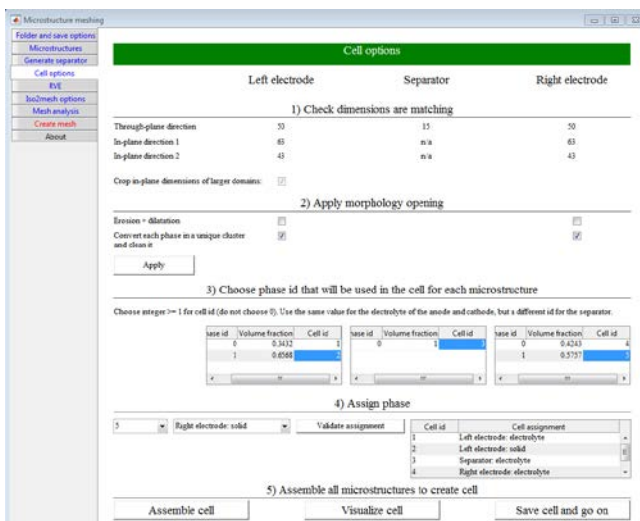


Impact of particle heterogeneities on lithium plating and lithium plating mitigation through graded electrodes

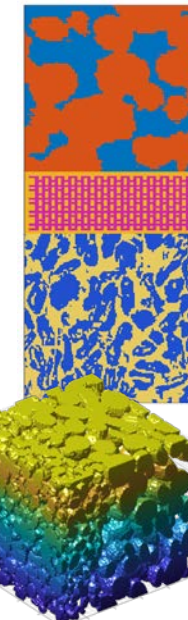


Support DOE extreme fast charge program BAT339

- Variable particle morphology/orientation/size distribution
- Multi-layer and/or graded electrodes
- Provide high quality, non-structured, tetrahedron-based meshes, simply from standard .tif files of the 3D segmented volumes



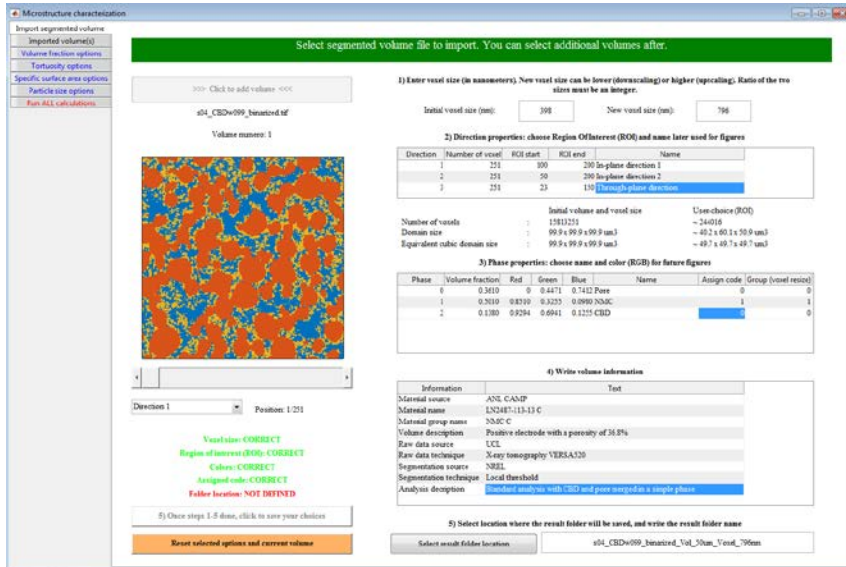
GUI organized in tabs, for each step of the meshing process



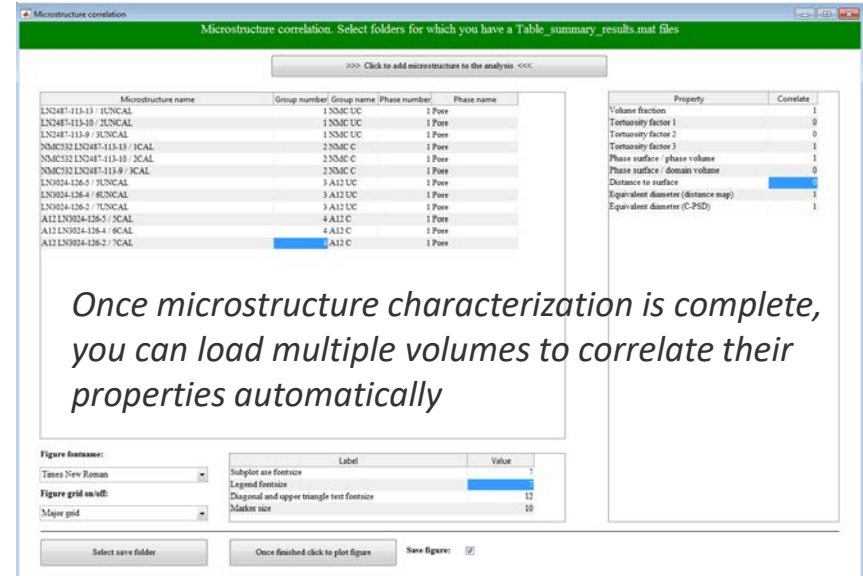
- Region Of Interest (ROI), rescaling
- Morphology opening
- Control mesh density and surface smoothness
- Clean vertex-2-vertex and line-2-line contact
- Calculate mesh quality
- Export vertex and cell connectivity

# Examples and Applications: Microstructure Parameters

## • Microstructure characterization



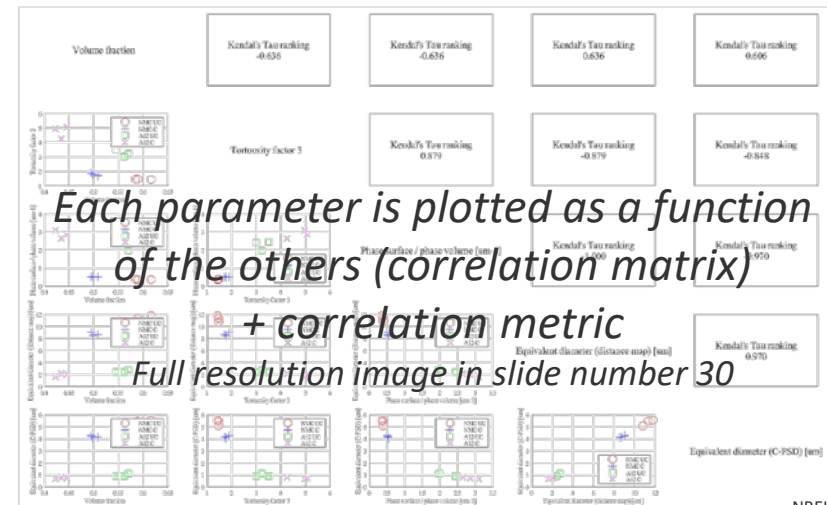
## • Microstructure parameters correlation



Once microstructure characterization is complete, you can load multiple volumes to correlate their properties automatically

- Volume fractions, particle size distribution and morphology, tortuosity factor (*third-party open-source Taufactor*) geometric tortuosity & skeletonization, surface area
- Characterize multiple volumes sequentially
- Parameters plotted along position to investigate variation along thickness (graded materials)
- **Automated Representative Volume Element (RVE) analysis\***, with control of the subvolumes aspect ratio
- **Automated image resolution dependence analysis\***
- Results (.png, .fig, .xls) carefully sorted

\*Saves manual setting of hundreds of calculations per volume & provides error estimation



Each parameter is plotted as a function of the others (correlation matrix) + correlation metric

# Technical Accomplishments and Progress

## High Performance Computing of Batteries

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# Creating a Scalable, Iterative Solver Package for the Microstructure Model

## Problem:

- First iteration of the microstructure electrochemical model relied on direct solver (robust, but slow) as iterative solvers (faster, memory-cheap, but require well-conditioned systems to converge) proved to be unstable
- As a result, investigated volumes were too small (to keep central processing unit CPU time acceptable) and model could not be predictive (volumes not representative)

## Solution & approach

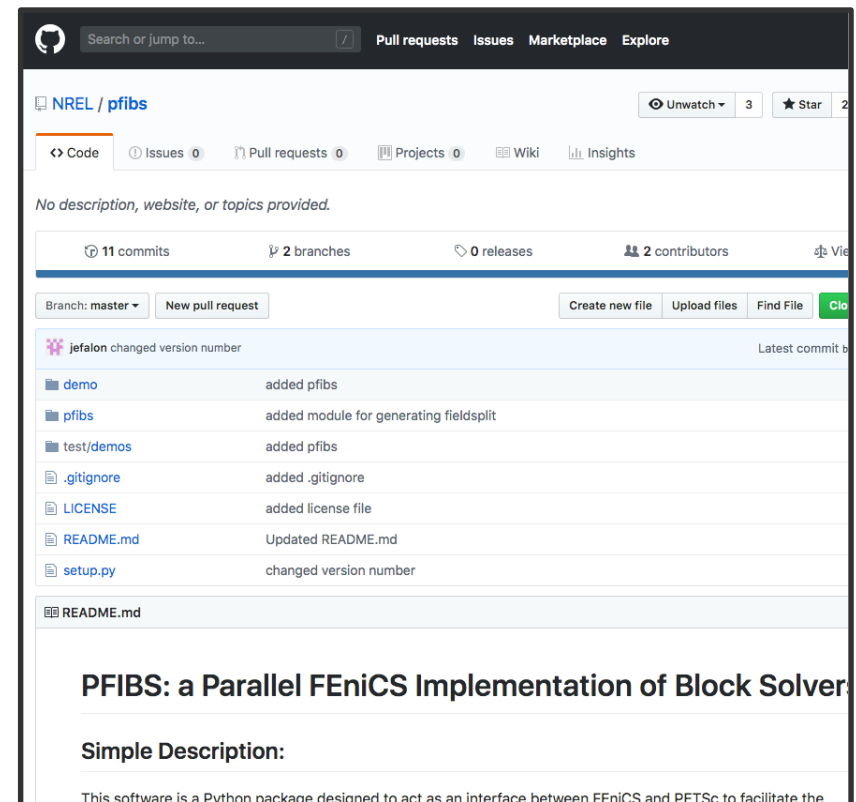
- Create a **scalable, iterative solver** package capable of handling **large meshes**
- Leverage the Portable, Extensible Toolkit for Scientific Computation (PETSc) backend to customize preconditioners to handle the poorly conditioned electrochemical model

### pFibs: a Parallel FEniCS

### Implementation of Block Solvers

- Provides easy access to PETSc's more advanced features
- Automatically sets up the block iterative solver for the electrochemical model

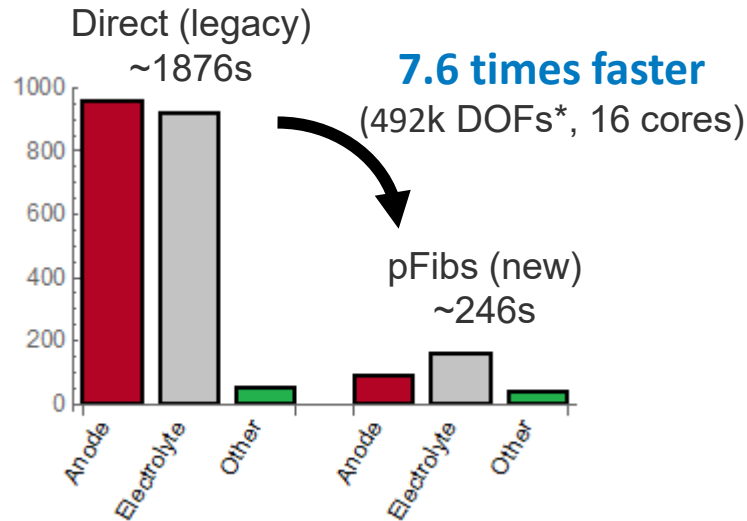
Open-source, available at  
<https://github.com/NREL/pfibs>





# Iterative Solver Impact on the Microscale Model's Time to Solution

Average Wall Clock Time (s) per Time Step:



pFibs is even faster (up to 33 times) for larger domains for which the direct solver can only solve few step times (due to excessive CPU time).

Direct Mumps (legacy):

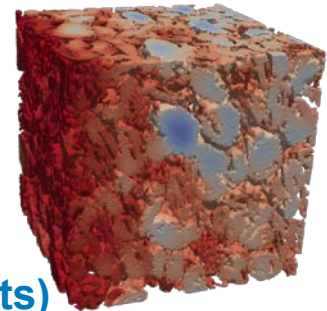
- Small Domains
- 492k DOFs\*
- $13.6 \times 13.6 \times 54.4 \mu\text{m}^{-3}$



↓ **Volumes ~38 times larger, DOFs x19**

pFibs, iterative (now):

- Large Complex Domains
- 9.2 Millions DOFs\*
- $74 \times 74 \times 69.5 \mu\text{m}^{-3}$
- **Representative volume (enables predictive results)**



**Electrolyte:**  $\frac{\partial c_e}{\partial t} = -\nabla \cdot N_e$      $N_e = -D_e \nabla c_e + \frac{t^+}{F} j_e$   
 $0 = -\nabla \cdot j_e$      $j_e = -\kappa_e \nabla \phi_e + \kappa_D \nabla \ln(c_e)$   
 $\kappa_D = (1 - t^+)(1 + A_e) \frac{2\kappa_e RT}{F}$

**Anode:**  
 $N_a = -D_a \nabla c_a$   
 $j_a = -\kappa_a \nabla \phi_a$   
 $\frac{\partial c_a}{\partial t} = -\nabla \cdot N_a$   
 $0 = -\nabla \cdot j_a$

**Cathode:**  
 $N_c = -D_c \nabla c_c$   
 $j_c = -\kappa_c \nabla \phi_c$   
 $\frac{\partial c_c}{\partial t} = -\nabla \cdot N_c$   
 $0 = -\nabla \cdot j_c$

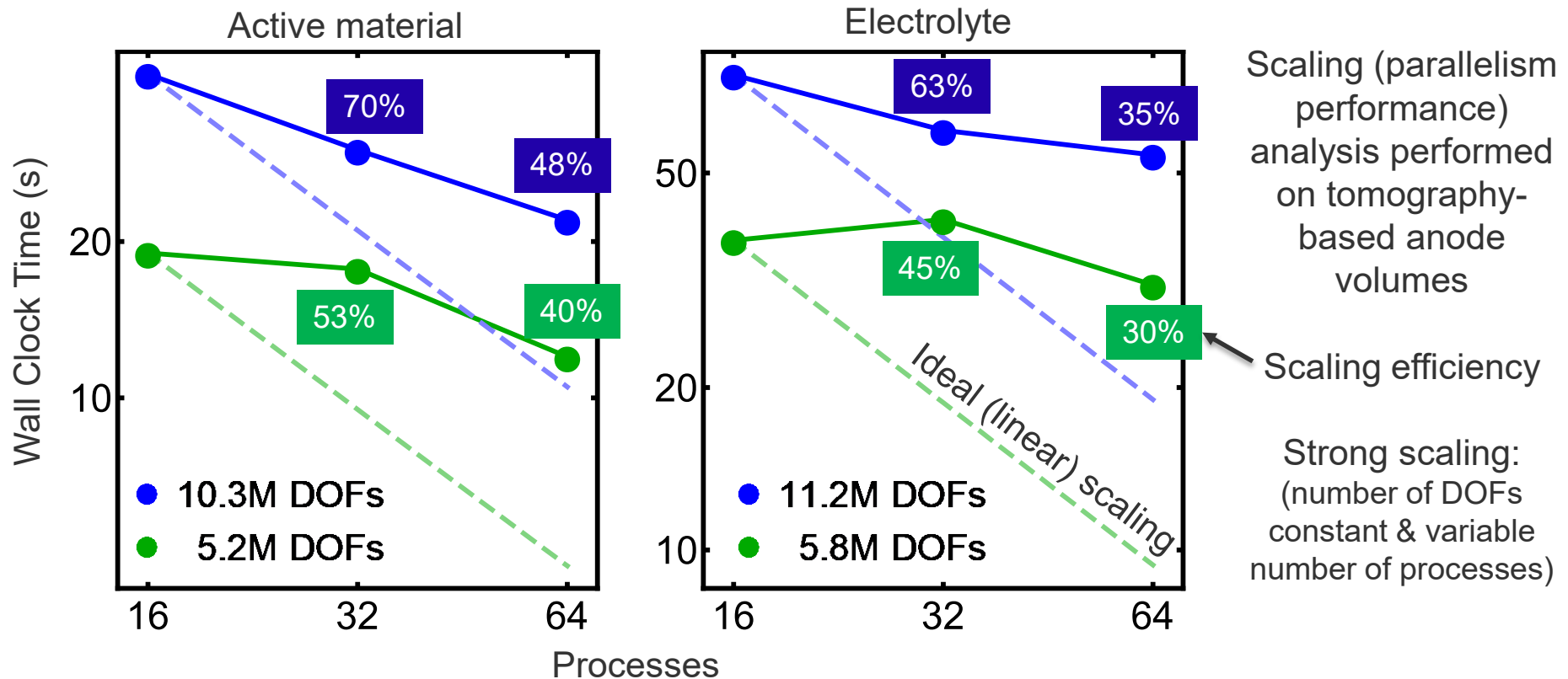
**Butler-Volmer Interface Condition:**  
 $N_s \cdot \mathbf{n} = N_e \cdot \mathbf{n} = \frac{i_{sc}}{F}$     and     $j_s \cdot \mathbf{n} = j_e \cdot \mathbf{n} = i_{se}$   
 $i_{sc} = k_0 \sqrt{c_s c_e (c_{smax})} \left( e^{\frac{2F}{RT}(\phi_s - \phi_e - U_0)} - e^{-\frac{2F}{RT}(\phi_s - \phi_e - U_0)} \right)$

- 6C CC (Constant Current) charge simulation performed on a **representative half-cell volume** ( $74 \times 74 \times 69.5 + 20 \mu\text{m}^3$ , 9.2 Million DOFs\*) now takes ~5 days with old-generation HPC, 32 cores.
- Model **tested up to 45 Million DOFs\*** and is stable, **enables future full-cell calculation.**

\*DOF: Degree Of Freedom



# Strong Scaling Parallel Performance with pFibs



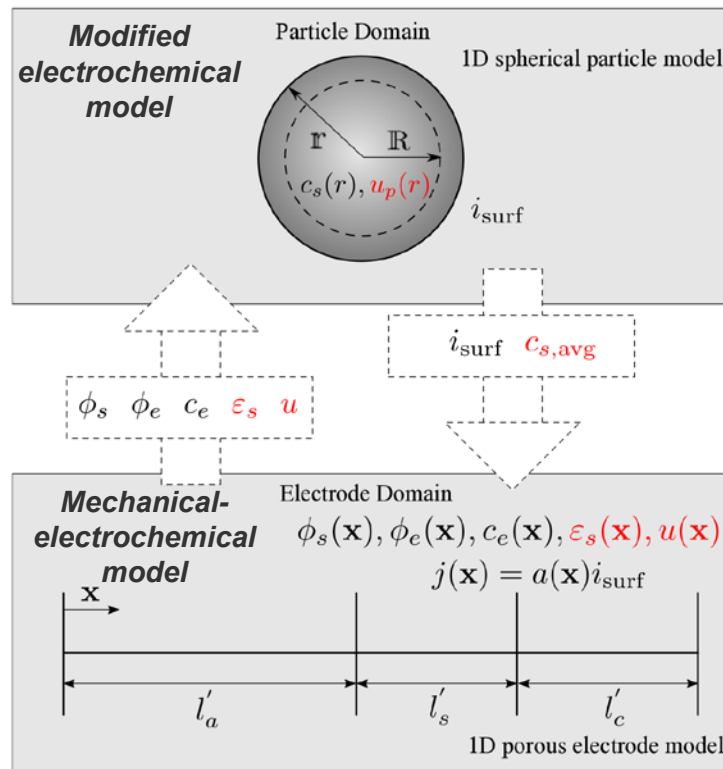
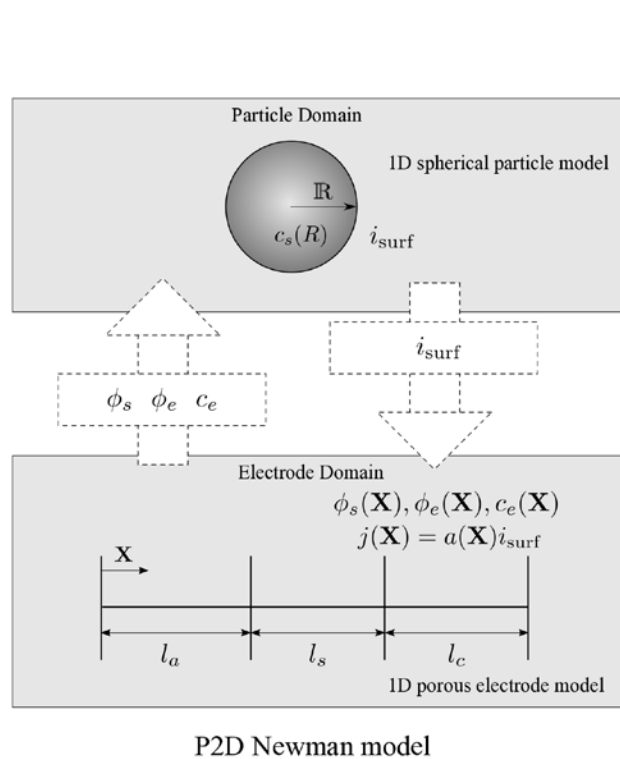
- pFibs achieves parallel speedup. **Scaling efficiency is increasing with domain size.**
- Static scaling analysis (technical back-up slide 32) indicates **larger domain will benefit from 64+ processes.**
- The electrolyte domain scales less well than the active material.

# Technical Accomplishments and Progress

Extension for Large Deformation Materials

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# Incorporating Particle/Electrode Mechanical Deformation into the Pseudo2D Electrochemical Model



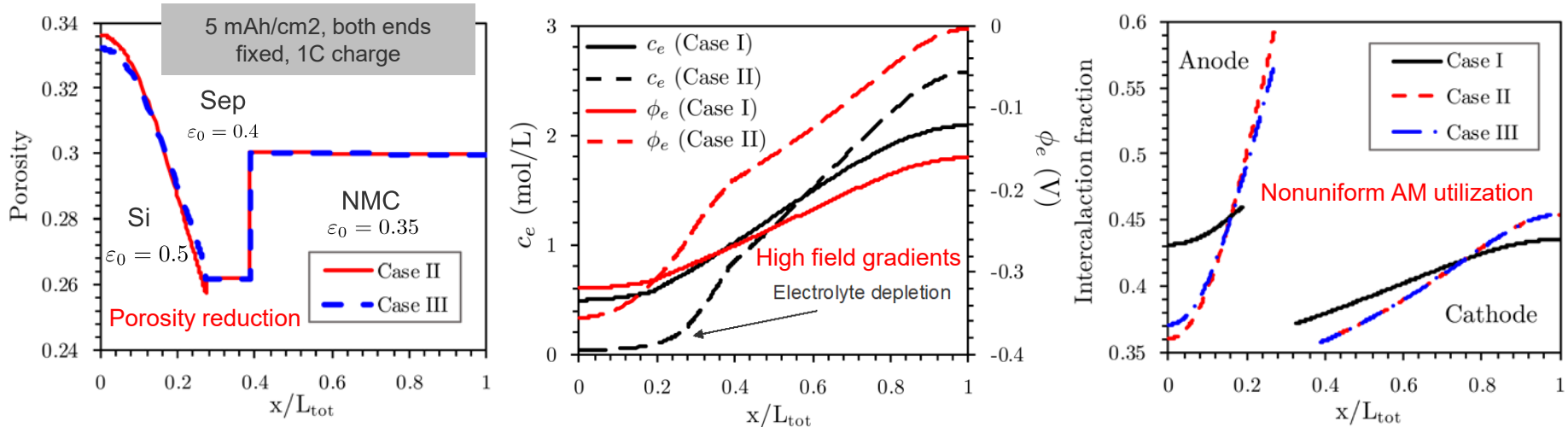
$c_s$ : Li concentration  
 $i_{\text{surf}}$ : surface current density  
 $u_p(r)$ : particle displacement

$\phi_s$ : solid potential  
 $\phi_e$ : electrolyte potential  
 $c_e$ : electrolyte concentration  
 $\varepsilon_s$ : solid volume fraction  
 $u$ : electrode domain displacement

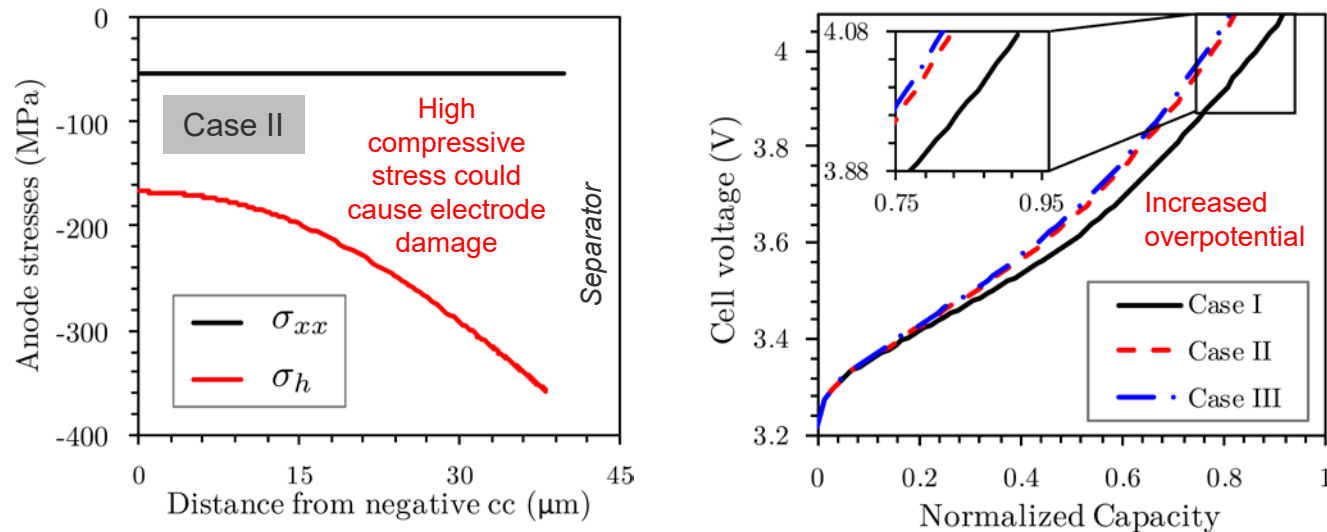
- High-capacity materials (Silicon, Tin) subject to large deformation
- **Goal:** consistently incorporate deformations based on the Pseudo2D (P2D) framework
- **Challenge:** infinitesimal deformation assumption inapplicable
- **Approach:** finite strain theory + reference frame reformulation of mass & charge conservation governing equations

# Deformation, Stress, and Effects on Cell Performance

**Case I:** P2D (ref)   **Case II:** P2D+deformations   **Case III:** Case II + stress-dependent Open Circuit Potential of Si

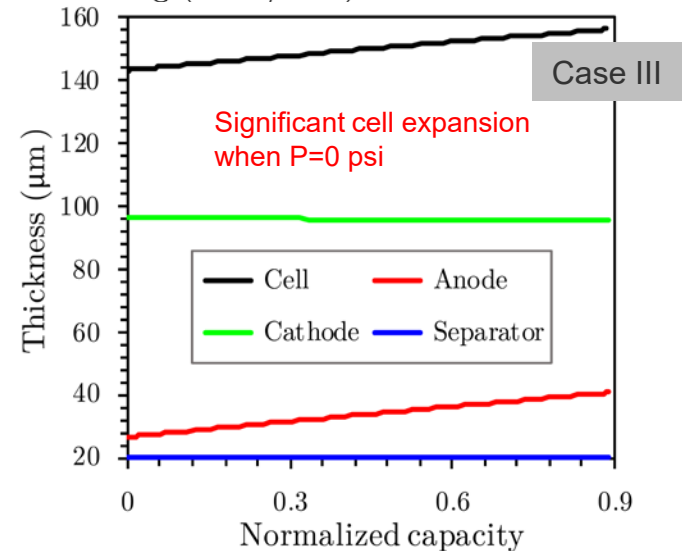
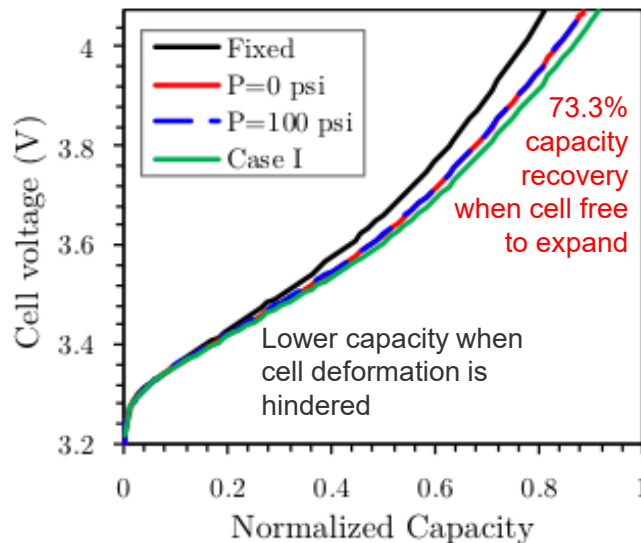
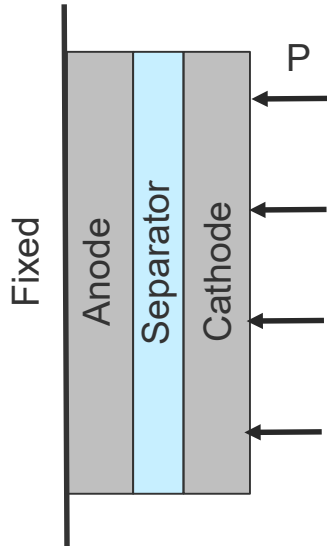
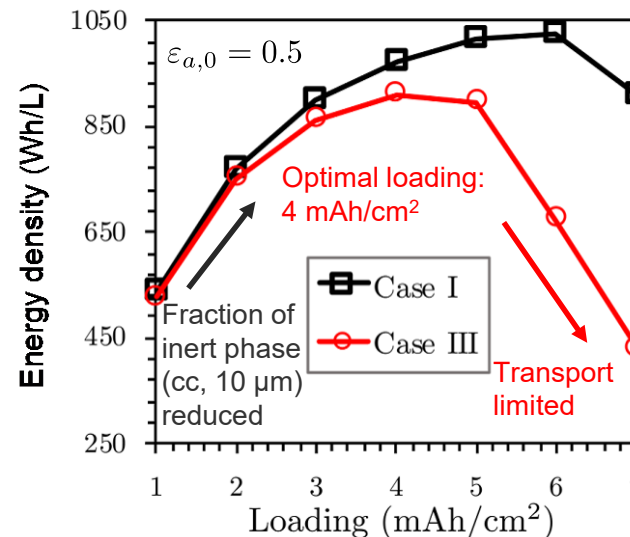
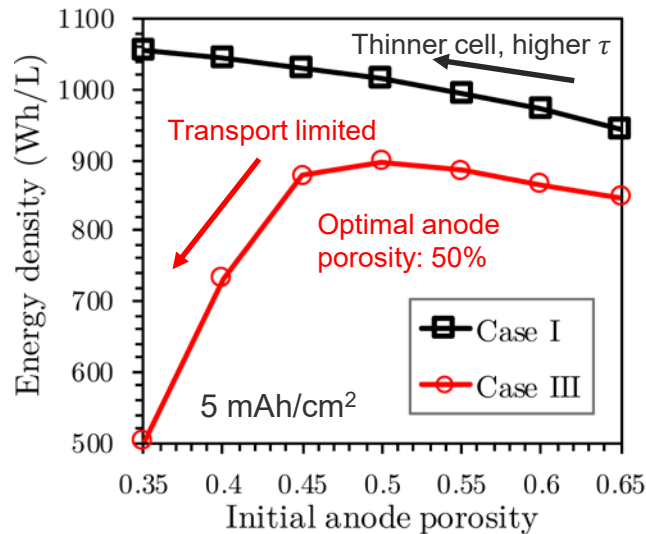


- Particle expansion → porosity reduction → increased cell-level inhomogeneity



- High compressive stress; cell capacity reduced by 9.16%

# Model Guidance on Optimal Cell Design



- Incorporation of deformations significantly affects model prediction
- Free cell expansion: capacity  $\uparrow$  9.86% but cell thickness  $\uparrow$  9.1%

# Technical Accomplishments and Progress

Extension to Multi-Phase Multi-Reaction and  
Polycrystalline Systems

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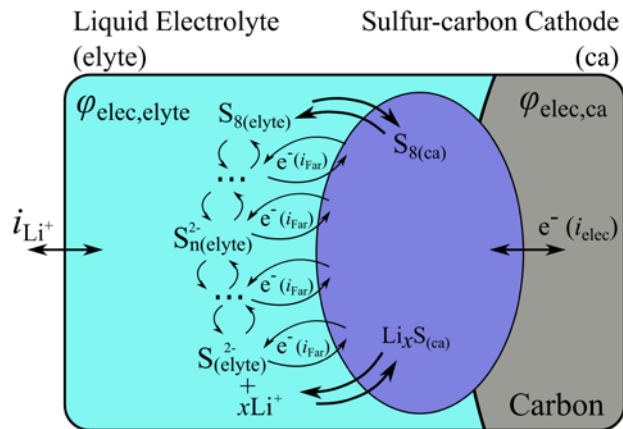
# Integrating Physics to Tackle Challenges of New Material Systems (initiated January 2019)

Path for integrating complex chemistry and mechanical evolution into HPC toolset

## 1) Multi-phase multi-reaction

### Li-sulfur system

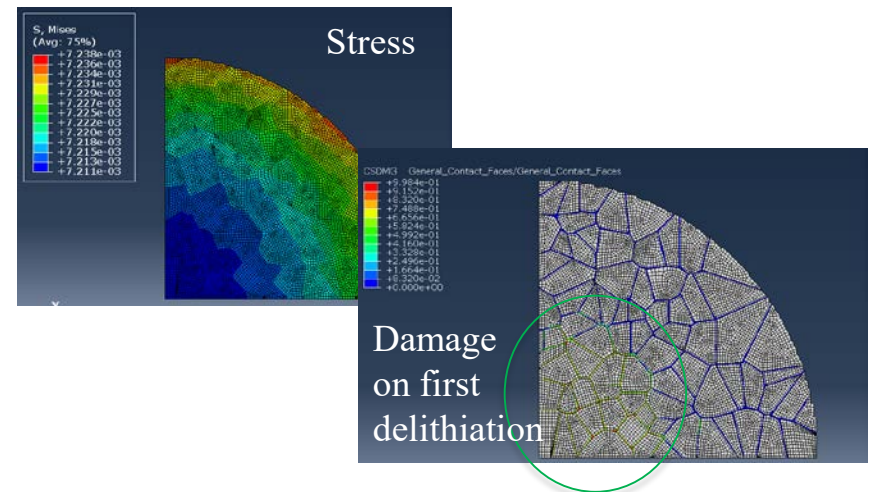
Professor Steven Decaluwe  
Colorado School of Mines



- Cantera open-source software treating generalized electrochemical-thermo-kinetic reactions
- Develop, validate electrochemical mechanism to identify dominant Li-S reaction pathways, species, thermodynamics
- Help assess mitigation strategies for polysulfide shuttling

## 2) Polycrystalline architectures

### High voltage NMC811








- Grain/particle geometry, anisotropic properties
- Model tracks cracking and surface area evolution of polycrystalline particles with cycling
  - Important for aging of NMC811
- Use model to clarify benefits of alternate particle architectures

# Responses to Previous Year Reviewers' Comments

- Comment: The effects of electrode thickness on microstructural-resistance analysis and rate capability need to be considered
- Response: We agree. This is an important consideration and has been captured in the models. Tortuosity is the primary parameter capturing ionic resistance across a thick electrode. Under this CAEBAT project, the microstructure model predictions of tortuosity – including carbon/binder effects – have been validated versus direct measurements and electrochemical rate capability experiments. That work was published in FY 19 in the Journal of The Electrochemical Society. Under the extreme fast charge program, BAT339, the models have been further validated at up to 9C charge rates and for electrodes with different active material morphologies (platelet, ellipsoid, sphere).
- Comment: The reviewer suggested looking at temperature-dependent materials models and how they might be implemented.
- Response: The electrochemical macro-homogenous model has been updated from isothermal to lumped thermal. Experimental determination of temperature-dependent coefficients (activation energies) is ongoing.

# Collaboration and Coordination with Other Institutions

Category	Institution	Role
National Laboratories	 Argonne National Lab <sup>1</sup>	Electrode/cell prototyping and characterization
Universities	 Purdue University (sub to NREL CAEBAT)	Stochastic electrode reconstruction & CBD generation for microstructure studies. Mesoscale electrode modeling
	 University College of London <sup>2</sup>	Nano and micro X-ray computed tomography
	 Brigham Young University <sup>2</sup>	Tortuosity measurement
	 University of California San Diego <sup>2,3</sup>	NMC811 samples with different size distribution & mud-cracking

1. Part of DOE Vehicle Technologies Office
2. Informal collaboration
3. Batt500 Energy Storage Program team member

# Remaining Challenges and Barriers

- Complexity of modeling volume change, phase evolution, chemistry of future battery material systems
- Linking first principles calculations with continuum scale models to better represent reactions and transport processes
- Obtain 3D images of CBD with sufficient field of view and resolution to validate morphology, including surface coverage and nano porosity
- Enhance stochastic reconstruction of CBD to capture mechanics
- Develop appropriate identification and validation experiments

## Future Work

- Enhance models as described above, including particle, carbon-binder, new chemistries, and electrode mechanics/degradation mechanisms. Validate.
- Investigate subparticle heterogeneities (e.g., crystal orientation) and their impact on degradation onset
- Apply models to electrode design studies for new materials, 3D architectures and applications, e.g., fast charge

Any proposed future work is subject to change based on funding levels

# Summary

- Developed open-source microstructure analysis open-source toolbox
  - Performs segmentation, generation, characterization, correlation, Representative Volume Analysis (RVA) and meshing (Supports extreme fast charge program BAT339)
  - To be released this summer together with already published [open-source battery microstructure library](#)
- Improved robustness and speed of 3D microstructure high-performance computing model
  - Developed pFibs: a Parallel FEniCS Implementation of Block Solvers
    - Speed-up problem solve by 8-33 times. Domain size 38 times larger, DOFs up to 45 Millions
  - Enables representative volume simulations that elucidate the impact of heterogeneity on electrode performance and degradation
    - Fully-resolved half cell simulation (e.g. 6C charge of  $74 \times 74 \times 69.5+20 \mu\text{m}^3$  volume; 9.2M degrees of freedom in ~5 days)
    - Performing quantitative analysis and electrode design recommendations (Supports extreme fast charge program BAT339)
- Reformulated classical Pseudo2D electrochemical model to efficiently incorporate large deformation at particle and electrode levels. Studied silicon anode system
  - Non-uniform stress along the anode thickness, with high compression near separator
  - Induces anode porosity variation that aggravates electrolyte depletion (transport limitation)
  - Free cell expansion mitigates anode porosity variation, thus allowing recovery of most of the lost capacity (~73%) due to the silicon strain, but increases cell thickness (~+9.1%)
- Multi-phase multi-reaction chemistry and evolution of mechanical damage are being incorporated into models to aid development of emerging Li-sulfur and NMC811 systems

# Acknowledgements

- We appreciate support and funding provided by the Vehicle Technologies Office at the U.S. Department of Energy.
  - Brian Cunningham
  - Samuel Gillard
  - Steven Boyd



# Thank You

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**[www.nrel.gov](http://www.nrel.gov)**

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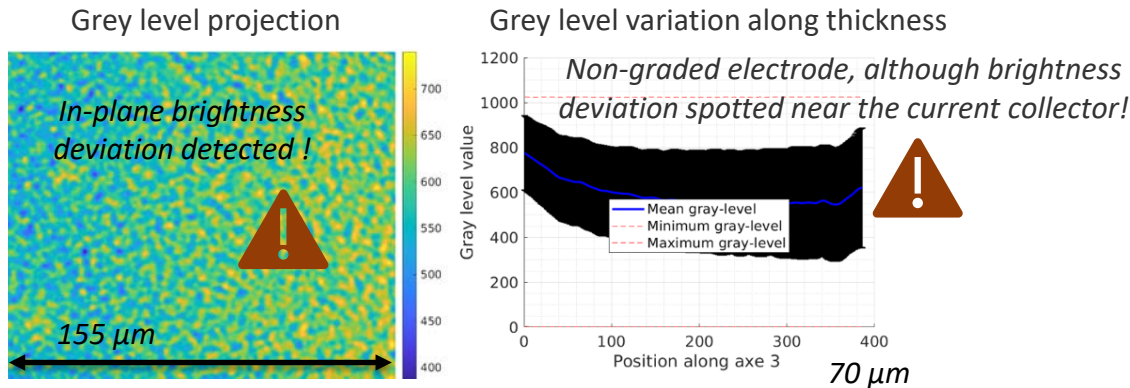


# Technical Back-Up Slides

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# Microstructure Analysis Workflow: Volume Preparation

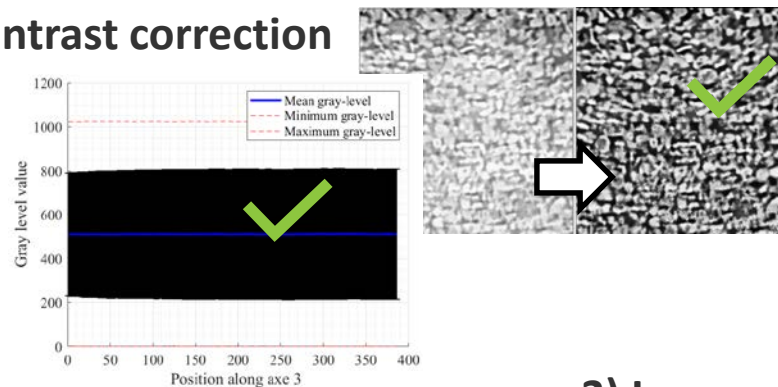
## 1) Image diagnosis



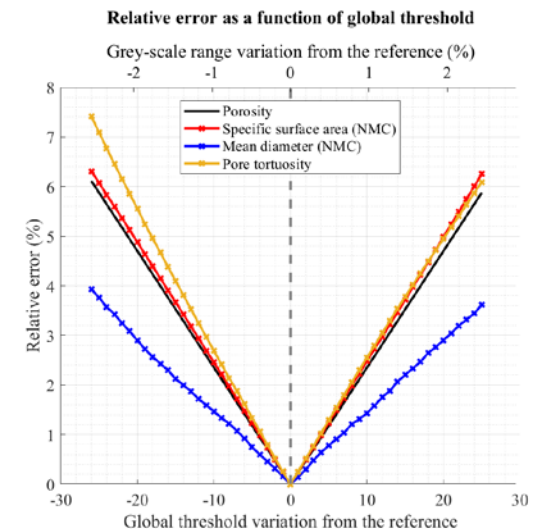
- “Simple” segmentation but in-depth analysis approach
- Performed with the NREL microstructure analysis tool

*Illustrated with SLC1506T2 (70  $\mu\text{m}$  thick, 144 x 155  $\mu\text{m}^2$  Field Of View FOV)*

## 2) Image contrast correction

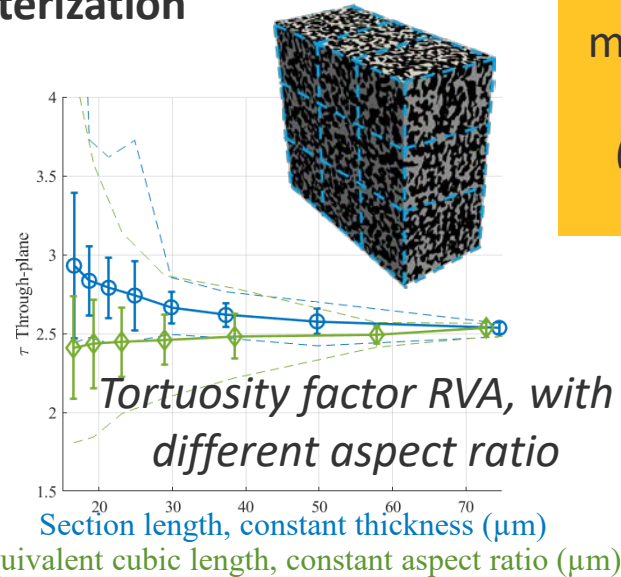
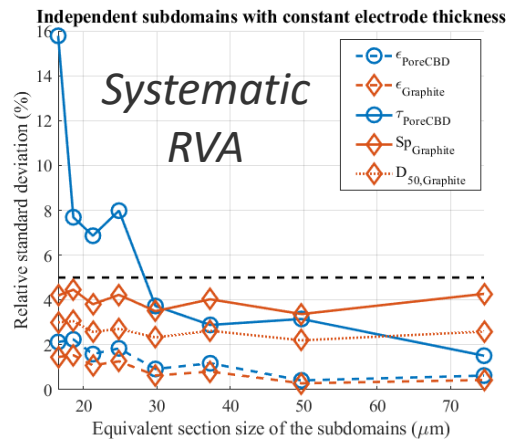


## 3) Image segmentation & segmentation error estimation



# Microstructure Analysis Workflow: Volume Characterization

## 4a) Microstructure characterization



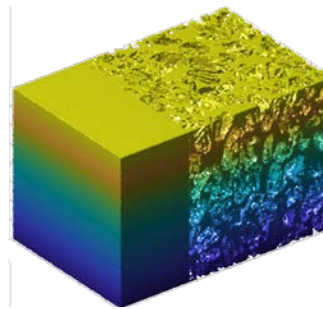
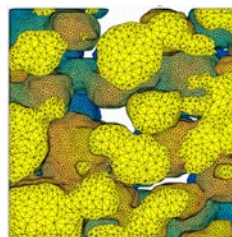
Performed with the NREL microstructure analysis tool  
*Illustrated with SLC1506T2*  
 (70  $\mu\text{m}$  thick, 144 x 155  $\mu\text{m}^2$  FOV)

Macro-homogenous modeling  
 relevance of the microstructure parameters is known

Microstructure parameters used for macro-homogenous are thoroughly evaluated (accuracy estimation)

- Different numerical methods → **property bounds estimation**
  - RVA → **representativeness evaluation**
  - Voxel size dependence → **error/extrapolation**

## 4b) Microstructure meshing

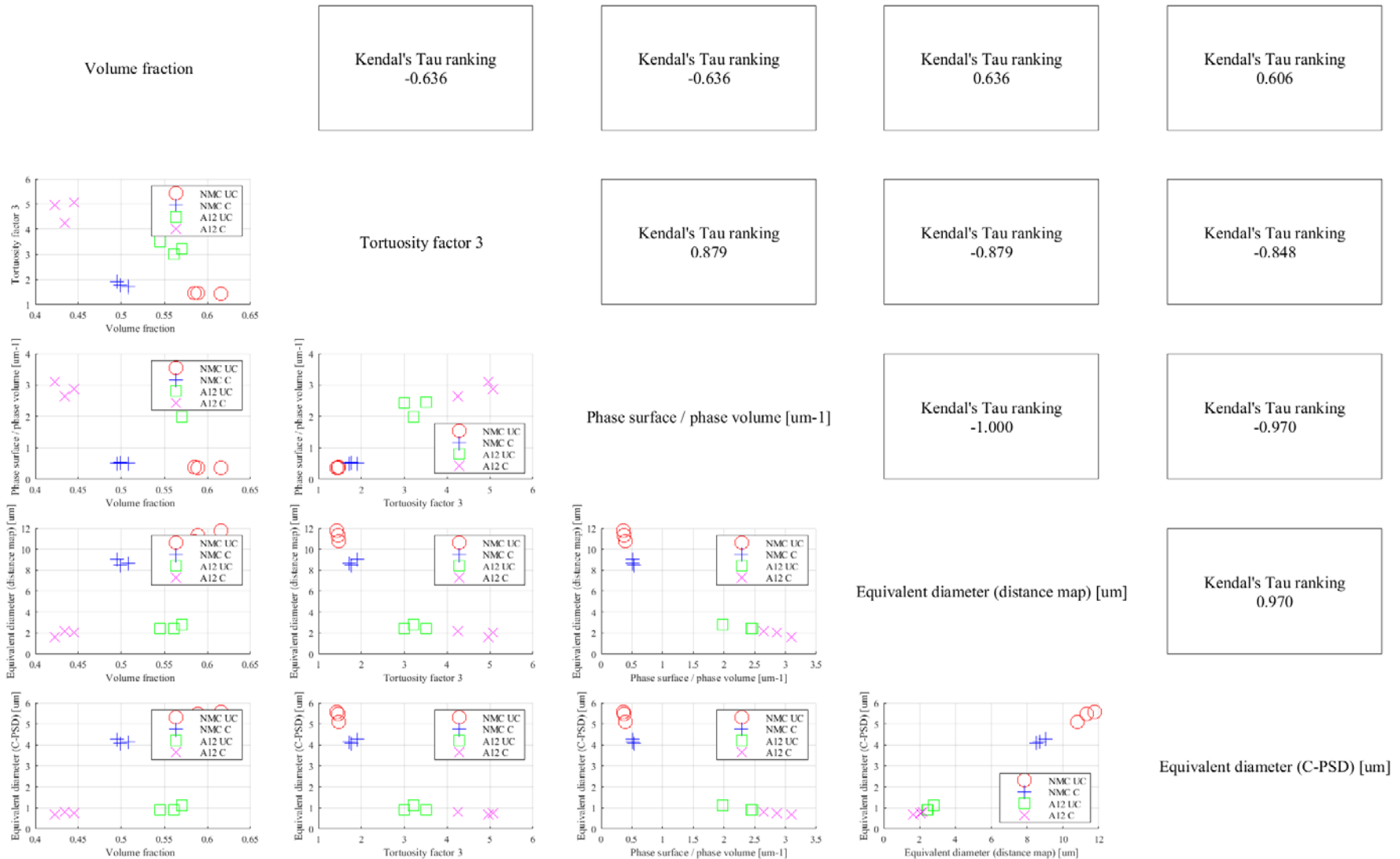


Micro-homogenous modeling

3b) Image segmentation or microstructure generation

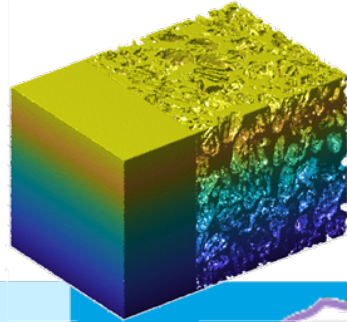
# Correlation Matrix for 14 Electrodes (7 Graphite, 7 NMC)

## Automatically Generated with the Microstructure Analysis Toolbox



*Objective: quickly identify if parameters are positively correlated (Kendal's tau ranking >0), negatively correlated (<0), or not correlated (=0)*

# Microstructure Electrochemical Model

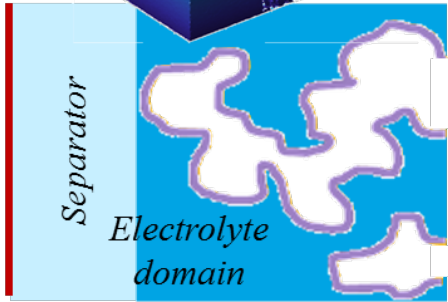


**Boundary conditions at the interface separator lithium plate**

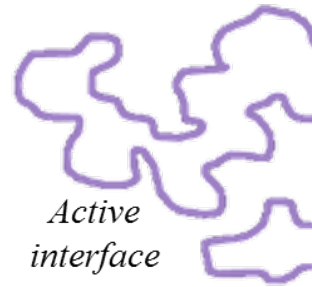
$$\phi_s = \phi_{reference}$$

$$\overline{N}_e \cdot \bar{n} = \frac{j_{se}}{F}$$

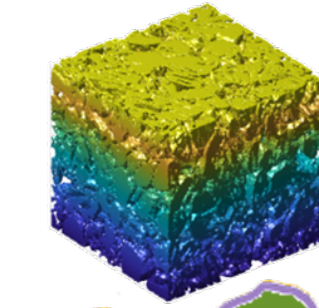
$$\bar{j}_e \cdot \bar{n} = j_{se}$$



**Segregated model:** solid and electrolyte domains are solved sequentially



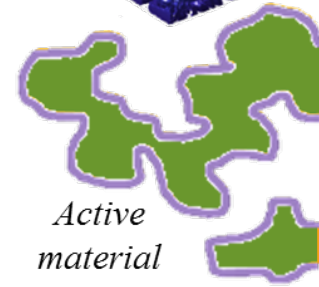
Active interface



**Boundary conditions at the interface solid current collector**

$$\bar{j}_s \cdot \bar{n} = j_{applied}$$

$$\overline{N}_s \cdot \bar{n} = 0$$



Active material

**Charge conservation:**  $\nabla \cdot \bar{j}_e = 0$

$$\text{With } \begin{cases} \bar{j}_e = -K_e \nabla \phi_e - K_D \nabla \ln C_e \\ K_D = \frac{2K_e RT}{F} (t_+^0 - 1) \text{ and assuming } \frac{\partial \ln f_+}{\partial \ln C_e} = 0 \end{cases}$$

**Mass conservation:**  $\frac{\partial (C_e e)}{\partial t} = -\nabla \cdot \overline{N}_e$

$$\text{With } \overline{N}_e = -D_e \nabla C_e + \frac{t_+^0}{F} \bar{j}_e$$

**Multiscale model**

$$\varepsilon(x) = \begin{cases} \varepsilon_{sep} & \text{if } x \in \text{separator} \\ 1 & \text{otherwise} \end{cases}$$

$$X_e(x) = \begin{cases} \frac{\varepsilon_{sep}}{\tau_{sep}} X_{e,dense}(C_e) & \text{if } x \in \text{separator} \\ X_{e,dense}(C_e) & \text{otherwise} \end{cases}$$

With  $X_e = D_e$  and  $K_e$  and  $\tau$  the tortuosity factor

**Boundary conditions at the interface solid-electrolyte (charge transfer)**

$$\overline{N}_e \cdot \bar{n} = \overline{N}_s \cdot \bar{n} = \frac{j_{se}}{F}$$

$$\bar{j}_e \cdot \bar{n} = \bar{j}_s \cdot \bar{n} = j_{se}$$

with

$$\begin{cases} j_{se} = i_0 \left\{ \exp\left(\frac{(1-\alpha)F\eta}{RT}\right) - \exp\left(-\frac{\alpha F\eta}{RT}\right) \right\} \\ \alpha = 0.5 \\ \eta = \phi_s - \phi_e - OCP \\ i_0 = F k_0 \sqrt{C_e} \sqrt{C_s} \sqrt{C_{s,max} - C_s} \end{cases}$$

No side reactions.

**Charge conservation:**  $\nabla \cdot \bar{j}_s = 0$

$$\text{With } \bar{j}_s = -K_s \nabla \phi_s$$

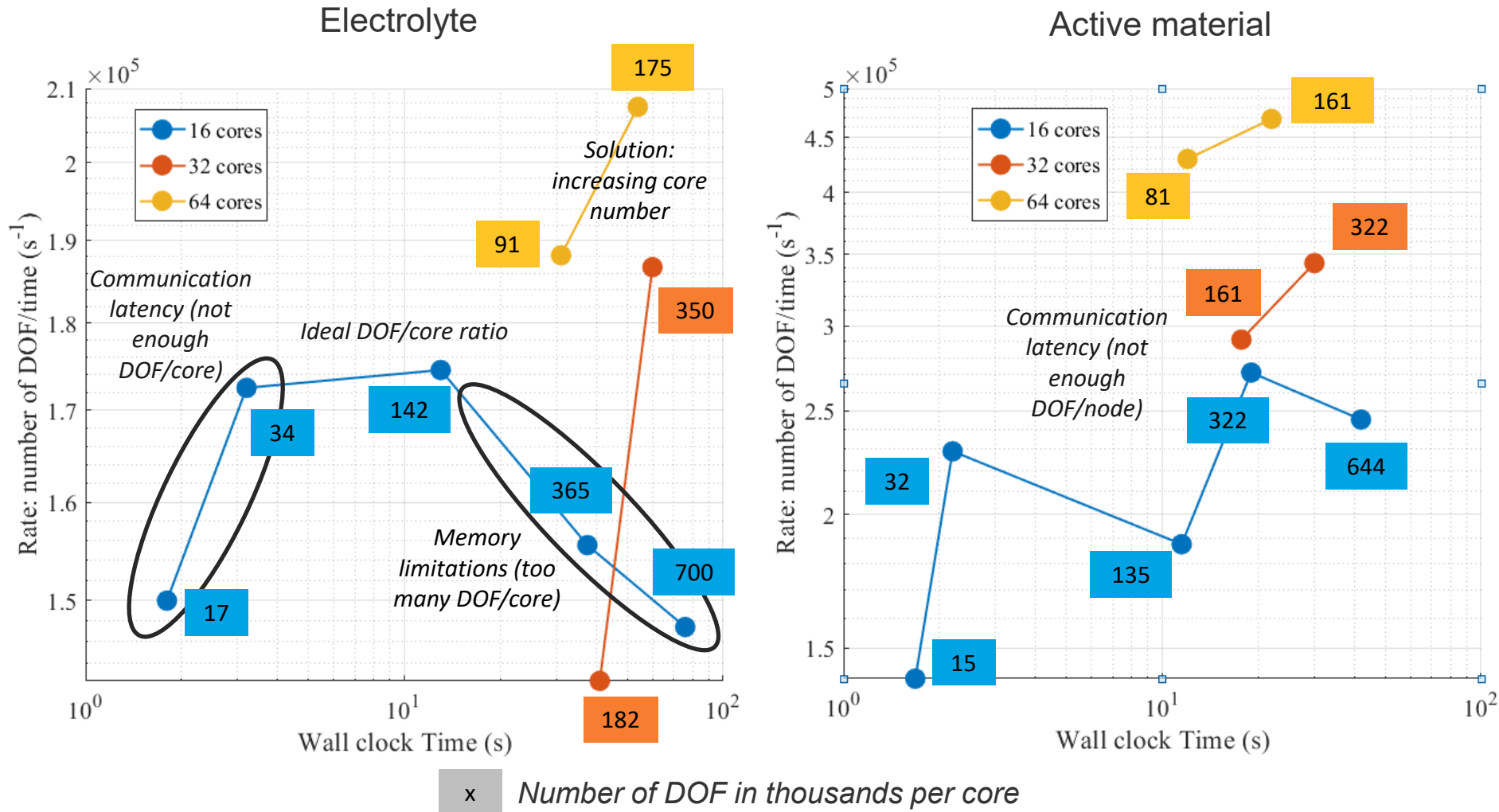
**Mass conservation:**  $\frac{\partial (C_s)}{\partial t} = -\nabla \cdot \overline{N}_s$

$$\text{With } \overline{N}_s = -D_s \nabla C_s$$

Finite Element open-source package **FEniCS** runs with **NREL High-Performance Computing** (up to 45 M degrees of freedom)



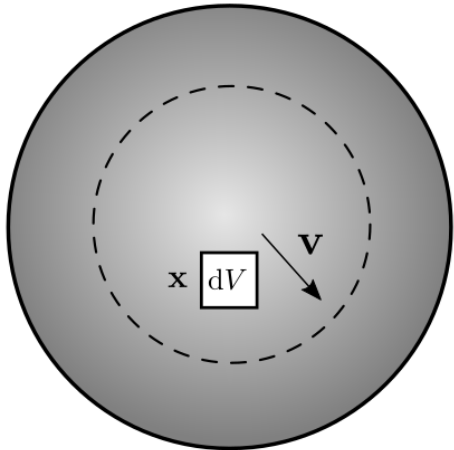
# Static Scaling Parallel Performance with pFibs



Static scaling holds the number of processes constant and varies DOFs. Electrolyte poor scalability can be enhanced by increasing number of core to prevent memory limitation for large domain size.

# Reference Frame Formulation of Conservation Laws

## □ Eulerian conservation law

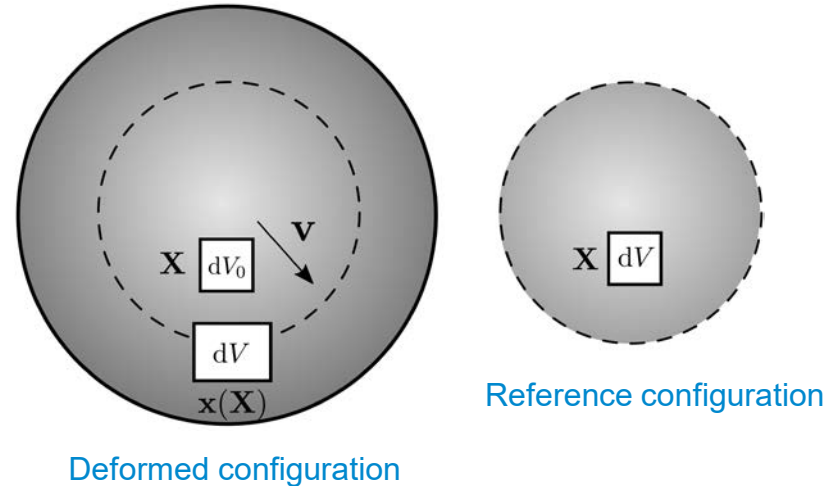


$$\frac{\partial c(\mathbf{x})}{\partial t} = -\nabla_x \cdot \mathbf{N}(\mathbf{x}) + R(\mathbf{x})$$

$$\mathbf{N}(\mathbf{x}) = -D\nabla_x c(\mathbf{x}) + c(\mathbf{x})\mathbf{v}(\mathbf{x})$$

- Volume element (fixed in space)
- Need to include a convection term
- Need to explicitly keep track of the deformation

## □ Lagrangian conservation law

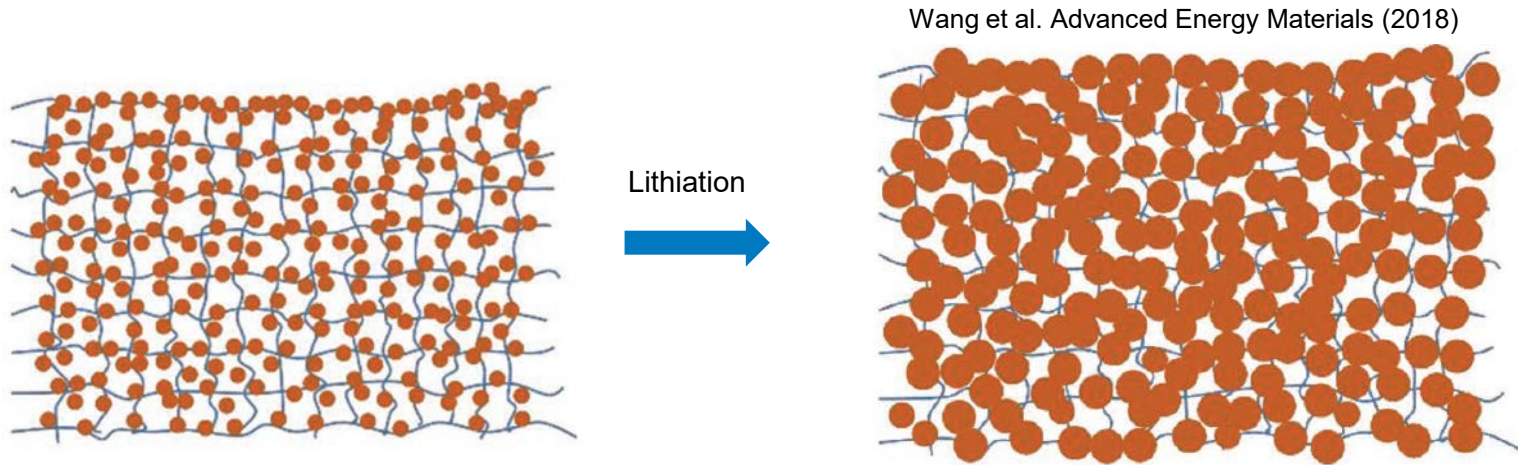


$$\frac{\partial}{\partial t} \left[ c(\mathbf{X}) J(\mathbf{X}) \right] = -\nabla_X \cdot \mathbf{N}(\mathbf{X}) + R(\mathbf{X}) J(\mathbf{X})$$

$$\mathbf{N}(\mathbf{X}) = -J\mathbf{F}^{-1}D\mathbf{F}^{-T}\nabla_X c(\mathbf{X}) = -D_X \nabla_X c(\mathbf{X})$$

- Approximate field distributions in the undeformed geometry
- Material volume:  $dV_0(\mathbf{X}) \rightarrow dV(\mathbf{x}(\mathbf{X}))$
- Effect of deformation on conservation is embodied in deformation gradient tensor  $\mathbf{F}$

# Example Formulation: Porosity Variation



- Active material (AM) expansion causes porosity reduction and electrode deformation

$$\underbrace{\left[ \frac{\partial \varepsilon_s}{\partial t} \right]}_{\text{Variation rate of solid volume fraction}} + \underbrace{\left[ \nabla \cdot (\varepsilon_s \mathbf{v}) \right]}_{\text{Electrode deformation rate}} = \underbrace{\left[ -\frac{s\Omega_e}{nF} j \right]}_{\text{Increase rate of AM volume}}$$

$\varepsilon_s$  : volume fraction of solid phase

$\Omega_e$  : partial molar volume of Li in electrode

$\mathbf{v}$  : local electrode velocity vector

$j = a(\mathbf{x})i_{\text{surf}}$  : volumetric current source

- Ratio of porosity reduction and electrode deformation depends on fixture condition
- Reference frame reformulation

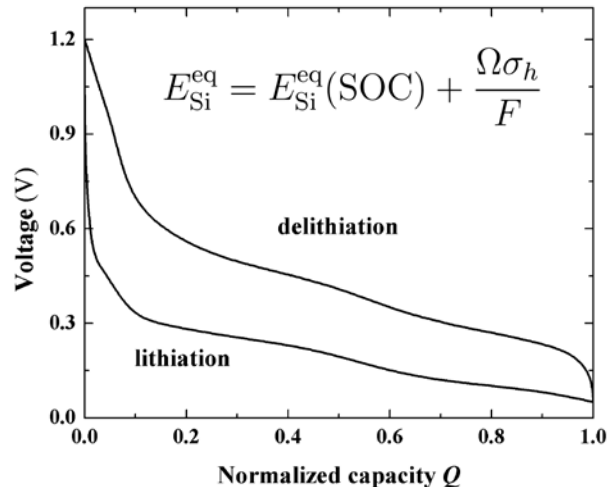
$$\frac{\partial(\varepsilon_s J)}{\partial t} = -\frac{s\Omega_e}{nF} j J$$

$$\varepsilon_e = 1 - \varepsilon_s$$

# Additional Multiphysics Coupling and Assumptions

## □ Stress-dependent OCP

Lu et al. Physical Chemistry Chemical Physics (2016)



Voltage hysteresis of  $\text{Li}_x\text{Si}$  system due to the effect of stress

## □ Porosity-dependent mechanical properties

Kovacik et al. Journal of materials science letters (1999)

$$E = E_s \left(1 - \frac{\varepsilon_e}{\varepsilon_0}\right)^n$$

$$\nu = \nu_s + \frac{\varepsilon_e}{\varepsilon_1} (\nu_0 - \nu_s)$$

## □ Specific surface area

$$a = \frac{3\varepsilon_s}{r(x)} = \frac{3\varepsilon_s}{\mathbb{R}} J_p^{-\frac{1}{3}}(x)$$

Couples particle deformation and porosity reduction

## □ Assumptions

- All deformations are elastic and nondestructive
- Uniform and isotropic deformation within each particle
- Negligible in-plane electrode deformation (thin electrode is well adhered to strong metal foil cc)
- Electrolyte moves out/into a material volume only in the out-of-plane direction
- Electrode is composed of only active material and electrolyte